





## Data Journalism

Michael Friendly Psych 6135

http://euclid.psych.yorku.ca/www/psy6135

# What is data journalism?

- Data journalism reflects the increased role of numerical data for reporting in the digital era. Data driven or DDJ more useful
  - Reflects increased interaction between journalists and {visualization design, computer science and statistics}.
- Aspects:
  - Database analysis: FOI requests on topics like crime, racial discrimination, judicial sentencing, toxic pollution, ...

  - Increasing use & development of data vis. software tools
    - analysis: R, python, ...
    - visualization libraries: R, D3, javascript, ...
  - Increasing use of dynamic updating of data sources
    - election polls / prediction
    - disease tracking

# **Topics**

- What is DDJ?
- Some early examples
- Modern examples
  - election reporting
  - health statistics
  - social media
- Best examples??
- Now trending

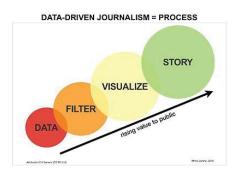
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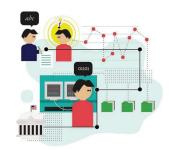
# What is data journalism?

To an outsider, it is often hard to tell concretely what #DDJ is, or is not

Two motivational infographics of #DDJ as a process

- How does it actually work?
- What makes it successful?





# Bill Dedman: The Color of Money

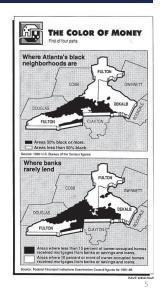
Bill Dedman of *The Atlanta Journal-Constitution* analyzed racial discrimination by banks and other lenders in middle-income black neighborhoods of Atlanta, GA.

In a series of articles, May 1-4, 1988, *The Color of Money*, he showed that although banks made loans in even the poorest white neighborhoods, they did not lend in middle-class or more affluent black neighborhoods.

This work won the Pulitzer prize in investigative reporting in 1989.

It helped establish the idea of computer-assisted reporting and the importance of compelling visualizations in telling the story.

See: http://powerreporting.com/color/ for all the articles and images



## **Hurricane Andrew**

- In Aug. 1992, a category 5 hurricane hit Miami-Dade county
- Huge numbers of houses were destroyed, but this varied by neighborhood
- Investigative reporters at the Miami Herald discovered why:
  - Building codes and inspection became lax after 1980.
  - Older homes survived.
- This report by Liz Balmaseda et al. won the Pulitzer Prize in 1993.

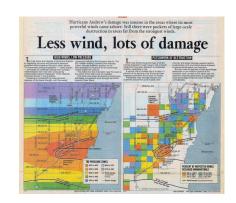


undamaged

Source: https://www.flickr.com/photos/juggernautco/sets/72157607210036175/

### **Hurricane Andrew**

- The report in the Miami Herald contained many detailed analysis maps
- There was compelling evidence for the cause of destruction.
- The combination of investigative reporting, analysis and graphics was seen as powerful



# **Predicting elections**

- In 1962, John Tukey and a statistical team joined with NBC to attempt to predict the congressional election
- Over time, they developed new methods to combine past results with exit polls and current returns to give up-to-date estimates and measures of uncertainty as the numbers came in
- · Key idea: "borrowing strength"
- Now known as "hierarchical Bayes"



Tukey (front, left) and Richard Link (front, right) as part of the NBC Election Day team in Rockefeller Plaza Studios with RCA/NBI in the harkernesed 1942 Photo courtery of the American Philosophical Society Tiday Architect

NBC execs were freaked out when the Tukey team began to call elections quite early with 95%, then 97.5% certainty.

They waited until it reached 99%, and missed the scoop.

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# **CNN Magic Wall**

Direct, interactive visualization of election news on TV took a big jump with the development of the Magic Wall, a large touch-screen display, tied to databases of election results, and with on-screen controls to zoom in/out, compare, highlight, etc.



Video: https://www.youtube.com/watch?v=rpLHnK-MSy4

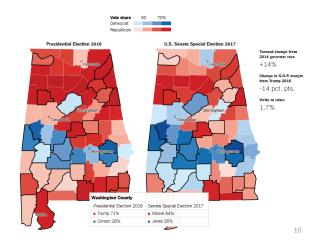
# Election reporting: NYT

In the special election for the Alabama U.S. Senate, Dec. 12, 2017, *The New York Times* used dynamic, interactive maps to compare the vote to the 2016 Presidential election

Hovering the mouse over a county showed the details

A map-based display is natural & easy

Q: What other graphic might show the comparison better?



# Election reporting: Dashboards

Throughout the evening of Dec. 12, the NYT dynamically updated dashboard displays of the election returns and model-based predictions of the winner

Doug Jones has won the election, according to A.P.



Two dials:

- Predicted outcome
- Certainty



>95% Jones

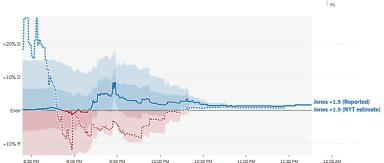
# **Election reporting: Dashboards**

Another dynamically updated chart showed the projected vote margin, together with two levels (50%, 95%) of uncertainty intervals for the current estimate.



Once all the votes have been counted, our estimated margin and the reported margin will match. As a rule, when our estimated margin is steady, our forecast is more trustworthy.





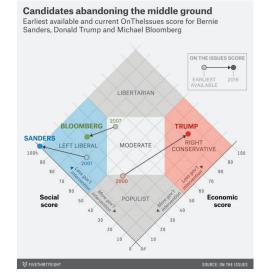
# Novel graphic designs

This graph, from fivethirtyeight.com was designed to show how some presidential candidates had shifted positions before the 2016 election.

The axes are a score on social and economic policy, but they rotated the axes by 45° to create zones related to political thought.

This info graphic is eye-catching and self-explanatory:

- · colored/labeled zones
- interpretive labels on axes
- arrows showing movement to extremes



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### Measles and vaccines

### Visualizing the impact of health policy interventions

In 2015 Tynan DeBold & Dov Friedman in the Wall Street Journal tried to show the effect of the introduction of vaccination programs in the US states on disease incidence, using color-coded heat maps for a variety of diseases

The long time series ~70 years made this work.

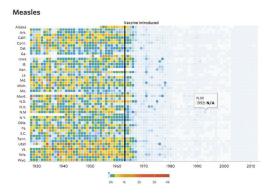
The heat map color scale is not exemplary, but the message is still clear: disease incidence declined after vaccines were introduced.

The images are "interactive," in the weak sense that tool-tips are shown on mouse movement.

explicitly.

topic.

graphs is a growing



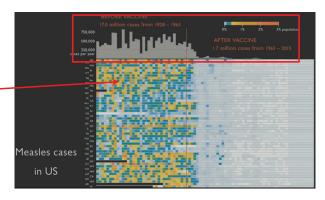
Source: http://graphics.wsj.com/infectious-diseases-and-vaccines/

# Making the message more explicit

What you should try to show here in an Info graphic is the overall impact of vaccination on measles

Ed Tufte did this by adding a histogram at the top showing total # of cases by year

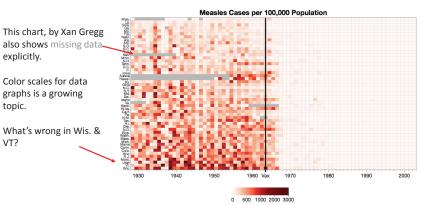
With the overall impact made clear, details about individual states can now be explored



# Effect ordering & color scales

Ordering the states by an overall measure of measles incidence makes it easier to study

A uni-dimensional scale of color is more effective than the ad-hoc scale used in the original

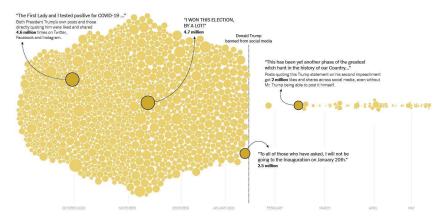


From: https://community.jmp.com/t5/JMP-Blog/Graph-makeover-Measles-heat-map/ba-p/30550

# Before – After Circle Chart

# What Happened When Trump Was Banned on Social Media?

- Circles are statements by Trump.
- Circle size ~ likes & shares on social media



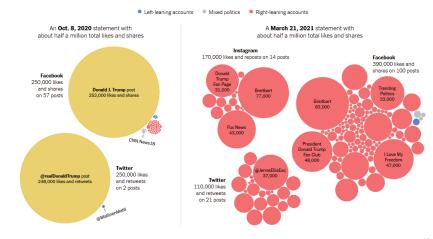
https://www.nytimes.com/interactive/2021/06/07/technology/trump-social-media-ban.html

<u>ml</u>

# Before – After: Who pushed the lies?

How/Who Spread Trump statements before and after the ban

Posts referencing each Trump statement, sized by total number of likes and shares



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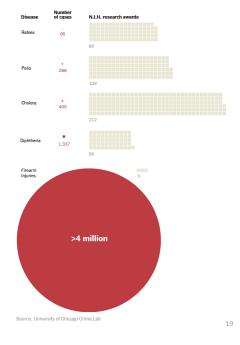
# Health & research funding

This powerful NYT chart compares cases of diseases and firearm injuries to the number of N.I.H. research awards.

How well do you like this design?

Is it a fair depiction of the data?

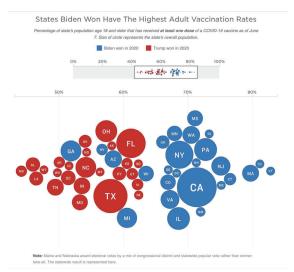
Can you suggest anything different?



## Votes for vs. COVID vaccinations

% of state pop. with at least one dose, vs. who won in 2020

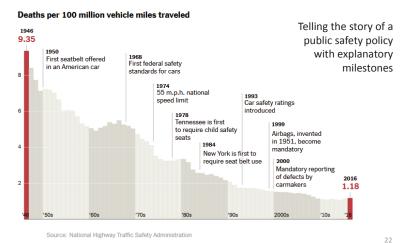
circle size ~ state pop.



From: https://twitter.com/kjhealy/status/1402691186826039301

## Seatbelts

New York Times: An annotated chart of vehicle deaths in relation to seatbelts



# Best examples of DDJ? Ask Twitter

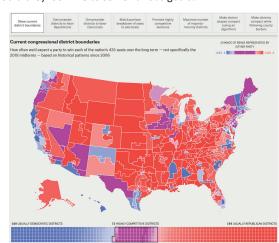


# 538: Atlas of Redistricting

There's a lot of complaining about gerrymandering, but what should US Congressional districts look like? What would they look like to serve various goals?

This map shows the current boundaries, with expected wins by Rep and Dem.

Why do I find this app appealing?



From: https://projects.fivethirtyeight.com/red istricting-maps/ From: https://projects.fivethirtyeight.com/red istricting-maps/

# 538: Atlas of Redistricting

How could district boundaries be re-drawn to promote more competitive elections?

Election district boundaries are consequential & highly political. They can be changed by state legislatures.

Different scenarios show the changes in representation, w/o a single voter switching parties! Description of district foliables of districts foliable of districts of

# 538: Atlas of Redistricting

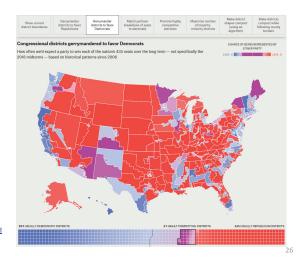
What if the Democrats could control election districts to favor themselves?

Note that the overall impression of the map is still Rep. overall.

Changes in representation take place largely on the east/west coasts

rom:

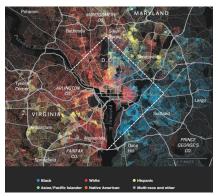
https://projects.fivethirtyeight.com/red istricting-maps/



# WP: Segregation in U.S. Cities

Aaron Williams & Armand Emandjomeh at the Washington Post studied changes in racial composition and diversity in U.S. cities over 30+ years

They relate these to demographic, policy, and urban/suburban issues using well-designed thematic maps.



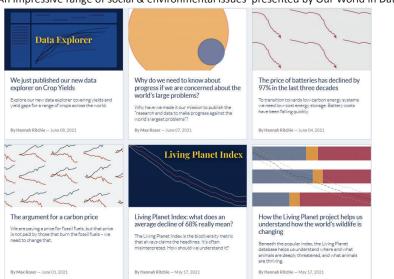


From: https://www.washingtonpost.com/graphics/2018/national/segregation-us-cities/

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## Our World in Data

An impressive range of social & environmental issues presented by Our World in Data



### Financial Times COVID tracker



This series of charts from the Financial Times was hailed for best-practices in the early stages of the pandemic.

- Log scale make it easy to compare rates of increase
- Visual meaning for "leveling the curve"
- Labels for interventions (lockdown)
- Sensible (relative) origin days since 10<sup>th</sup> death

The @FinancialTimes coronavirus death & case trajectory trackers are now FREE TO READ outside the paywall: ft.com/coronavirus-la...

In this morning's update, the US has gone above 470 deaths, bringing it just behind where Iran was at the same stage.

Coronavirus deaths in Italy, Spain and the UK are increasing much more rapidly than they did in China Cumulative number of deaths, by number of days since 10th death
Nationwide lockdowns: 

South to be compared to be co

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## **Toronto Star: Trump Lies**

Daniel Dale & Ed Tubb at the *Toronto Star* maintained a database of every false claim made by Donald Trump since the Inauguration on Jan. 20, 2017



# Donald Trump has said 4557 false things as U.S. president (as of 3-13-2019)

Interactive filter at: http://projects.thestar.com/donald-trump-fact-check/

# Toronto Star: Trump Lies

Every false claim is documented: place, claim, truth, "slug", categories

| -  | number |    | date       | place            | claim                       | infact                            | slug     | repeat | source                              | ategory1 °       | category    |
|----|--------|----|------------|------------------|-----------------------------|-----------------------------------|----------|--------|-------------------------------------|------------------|-------------|
| 1  |        | 1  | 2017-01-20 | Post-inauguratio | "I looked at the rain, whic | The rain began right at the beg   | Inaugu   | Yes    | https://www.thestar.com/ne          | nauguration      | Weather     |
| 2  |        | 2  | 2017-01-20 | Post-inauguratio | "Even the media said the c  | The major media reported that     | Inaugu   | Yes    | https://www.thestar.com/ne I        | nauguration      | Exaggera    |
| 3  |        | 3  | 2017-01-21 | Speech at Centr  | "Honestly, it looked like a | The crowd, which may not have     | Inaugu   | Yes    | https://www.youtube.com/w 1         | nauguration      | Exaggera    |
| 4  |        | 4  | 2017-01-21 | Speech at Centr  | "It was almost raining, the | Neither of these claims is true   | Inaugu   | Yes    | https://www.youtube.com/w I         | nauguration      | NA          |
| 5  |        | 5  | 2017-01-21 | Speech at Centr  | "So a reporter for TIME ma  | Trump's numbers are well off. H   | TIME co  | Yes    | https://www.youtube.com/w           | Media            | Exaggerat   |
| 6  |        | 6  | 2017-01-23 | Private meeting  | Trump told Congressional    | This claim, also reported by nu   | Mass fr  | Yes    | http://www.foxnews.com/pol          | /oter fraud      | Election    |
| 7  |        | 7  | 2017-01-25 | Interview with A | "In terms of a total audien | "They" can mean anyone, but n     | Inaugu   | no     | http://abcnews.go.com/Polyti 1      | nauguration      | Exaggerat   |
| 8  |        | 8  | 2017-01-25 | Interview with A | "No, no, you have to unde   | Trump's victory was not close t   | Electio  | Yes    | http://abcnews.go.com/Boliti I      | lection          | Exaggerat   |
| 9  |        | 9  | 2017-01-25 | Interview with A | 'I think you're demeaning   | Saying 'you' here, Trump wron     | Media    | Yes    | http://abcnews.go.com/Politi 1      | Media            | Exaggerat   |
| 10 |        | 10 | 2017-01-25 | Interview with A | With regard to his speech   | Most of the audience was inde     | CIA spe  | no     | http://abcnews.go.com/Politi 1      | rump White House | US intellig |
| 11 |        | 11 | 2017-01-25 | Interview with A | Regarding Healthcare.gov    | Healthcare.gov did not cost \$5   | Healthc  | no     | http://abcne http://abcnews.go.c    | om/ are          | Exaggerat   |
| 12 |        | 12 | 2017-01-25 | Interview with A | Muir: 'I called the author  | Grovelling means 'to draw bac     | Grovelli | no     | http://abcne Politics/transcript-al |                  | NA          |
| 13 |        | 13 | 2017-01-25 | Interview with A | "Now you're telling me Pe   | Trump was trying to use a 2012    | Pew fra  | no     | http://abcne/interviews-president   |                  | Election    |
| 14 |        | 14 | 2017-01-25 | Interview with A | Regarding his false claim   | These large numbers of illegal v  | Mass fr  | Yes    | http://abcycomyrid=45047602         | rocer maud       | Election    |
| 15 |        | 15 | 2017-01-25 | Interview with A | Regarding voting fraud: "   | There is no evidence of a signifi | Mass fr  | Yes    | http://aycnews.go.com/Politi        | /oter fraud      | Chicago     |
| 16 |        | 16 | 2017-01-25 | Interview with A | Regarding voting fraud: "Y  | There is no evidence of a signifi | Mass fr  | Yes    | http://abcnews.go.com/Politi        | /oter fraud      | NA          |
| 17 |        | 17 | 2017-01-25 | Interview with A | *Look, Barack Obama if      | This is a gross mischaracterizati | Obama    | no     | http://abcnews.go.com/Politi I      | Barack Obama     | Voter frau  |
| 18 |        | 18 | 2017-01-25 | Interview with A | "So, look, when President   | There were not only no homici     | Obama    | no     | http://abcnews.go.com/Politi I      | Barack Obama     | Crime       |

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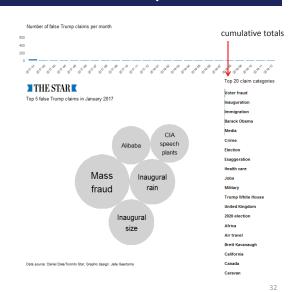
# Jelle Geertsma: Trump Lies

Graphic artist Jelle Geertsma designed this animated graphic showing the top 5 claim "slugs" & the top 20 categories over time, by month.

Bars at right show cumulative totals

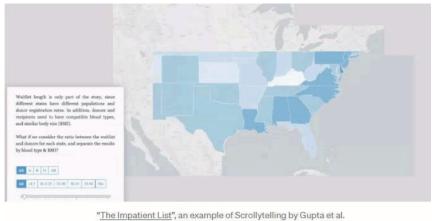
This animation uses the gganimate package.

A TrumpLies package is in progress. Ugh! Not so.



# Scrollytelling: The Impatient List

What it's like waiting for a kidney transplant in the U.S.



From https://xujunjiejack.github.io/

# Now trending ...

- Digital publishing and online, interactive media
  - Many news organizations have interactive graphic developers or entire online departments
  - A revenue stream responding to less from print & ads
- Story telling frames a wider enterprise
  - A focus for data visualization
  - New online forms: scrollytelling
- Open data
  - Maps-GIS (Google, Open Street maps)
  - Gov't data: census, health, crime, ...
  - NGO initiatives: Our World in Data
- Software infrastructure
  - Javascript as base for online, interactive methods
  - Libraries, frameworks building on this (D3.js, Processing, ...)

